Ultra boosted HH production study using ML

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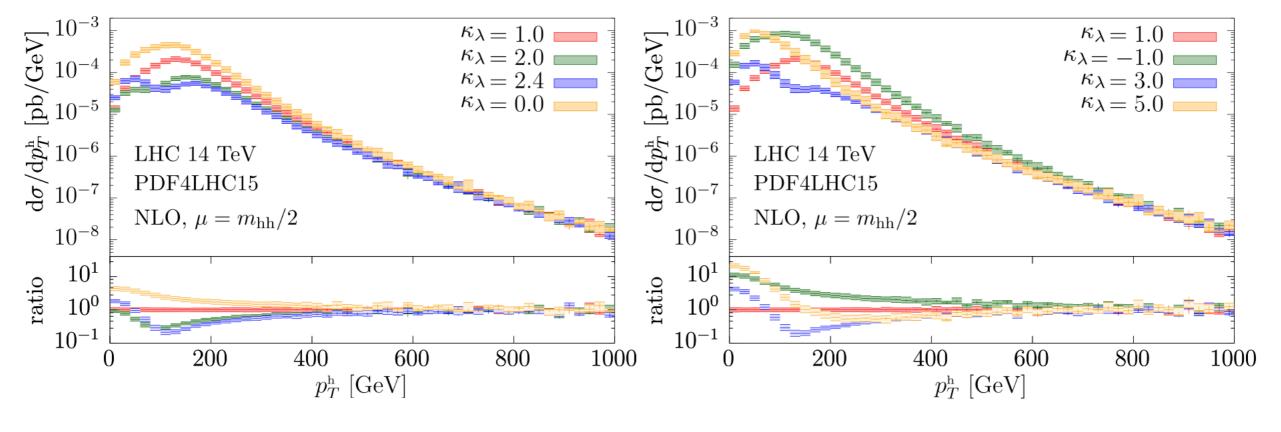
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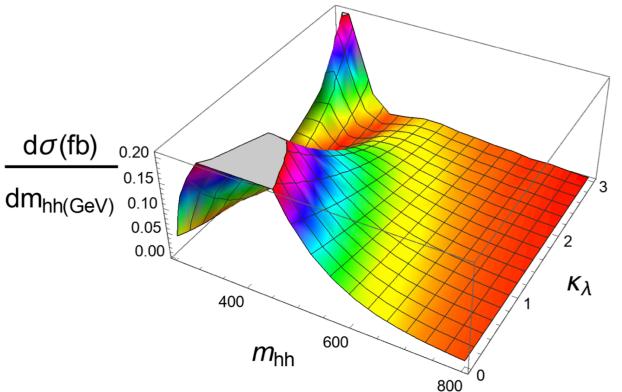






Di-Higgs production at higher energies



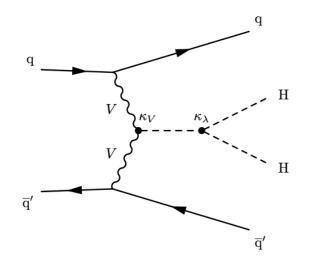


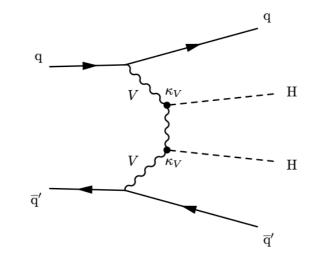
arXiv: 1910.00012

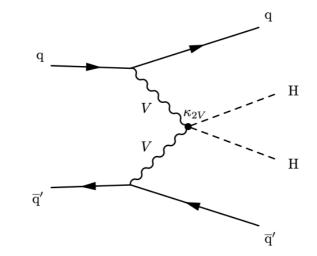
Major backgrounds are t-tbar, QCD

Recent ML application in HH study

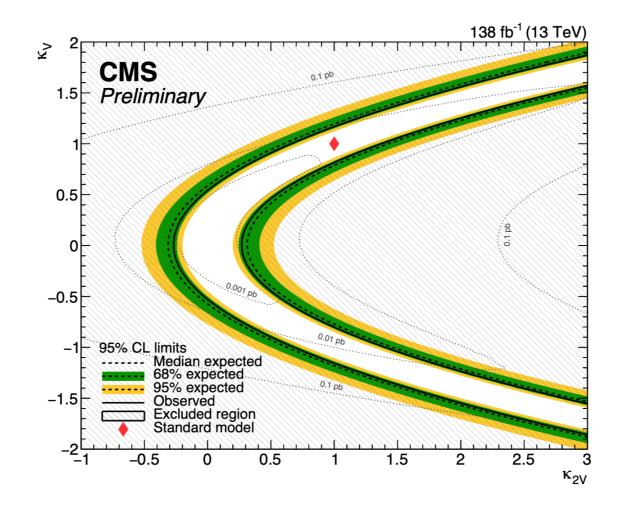
 $H \rightarrow b\bar{b}$ tagging is done using ParticleNet (GNN network)





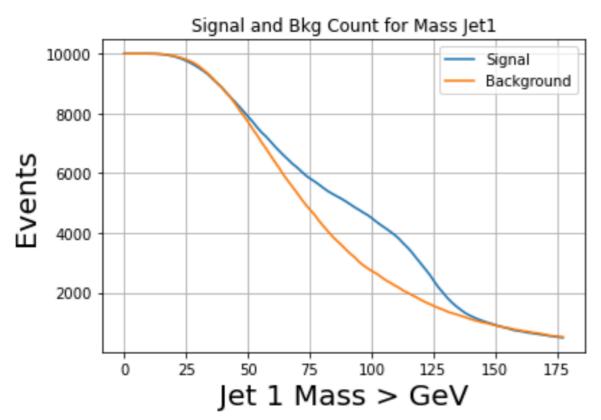


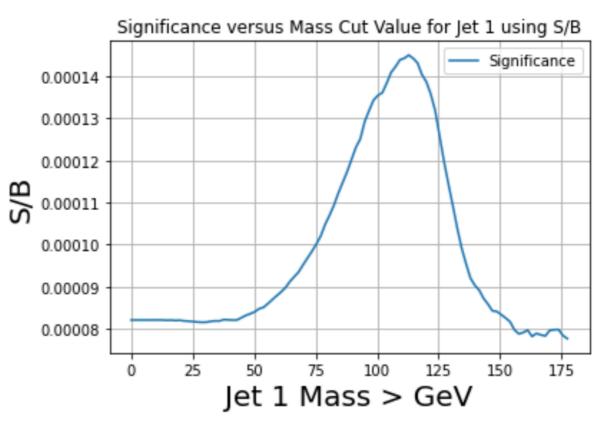
CMS PAS B2G-21-001

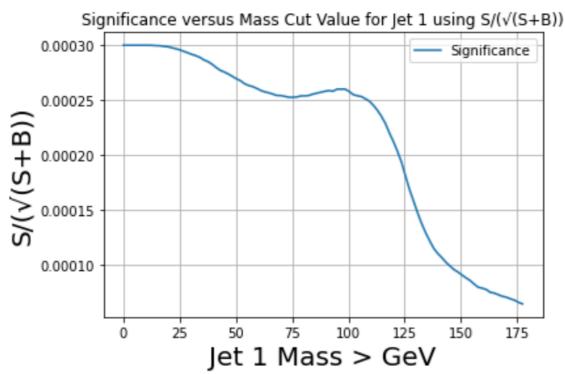


Classify events and scan the signal significance

Significance vs Mass



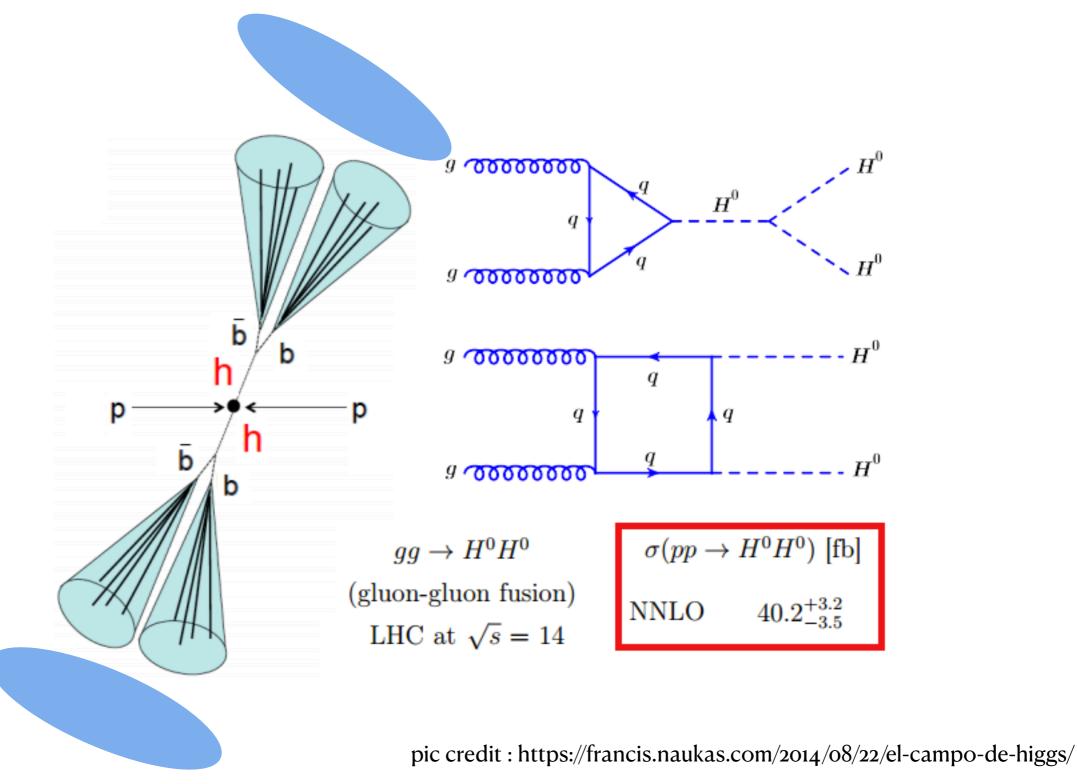




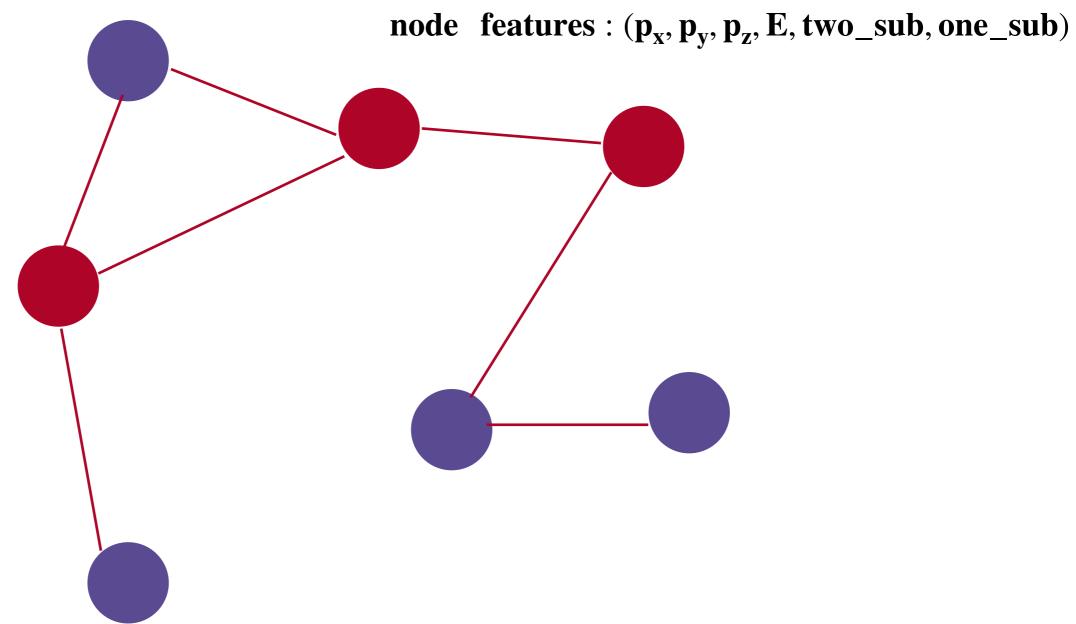
Event classification using GNN

For boosted di-Higgs production we look for two Ak-08 jets with track

subjets



Event as a graph



Locate all the R=0.8 PF jets and 0.4 track jets in the η , ϕ plane.

Connect the k-NN neighbour through edges.

For each nodes: assign 4-vector + two and one subjettiness observables. Use this graph representation for the events to be fed in GNN.

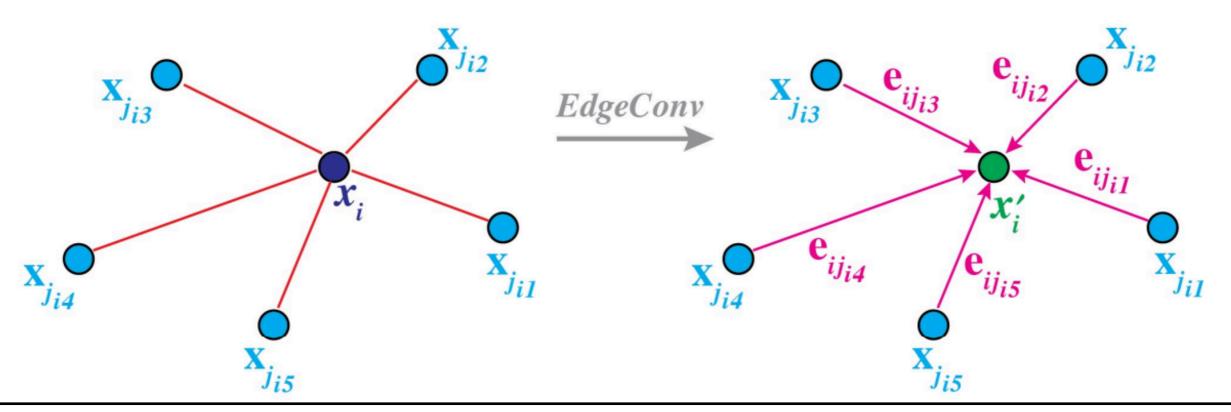
The graph network

https://arxiv.org/pdf/1801.07829.pdf

In a graph, each node can "learn" about the state of neighboring node through message passing operation

$$(x')_{i}^{l+1} = \max_{j \in \mathcal{N}(i)} \Theta_{x}(x_{j}^{l} - x_{i}^{l}) + \Phi_{x}(x_{i}^{l})$$

$$(e')_i^{l+1} = mean_{j \in \mathcal{N}(i)} \ \Theta_e(e_j^l - e_i^l) + \Phi_e(e_i^l)$$



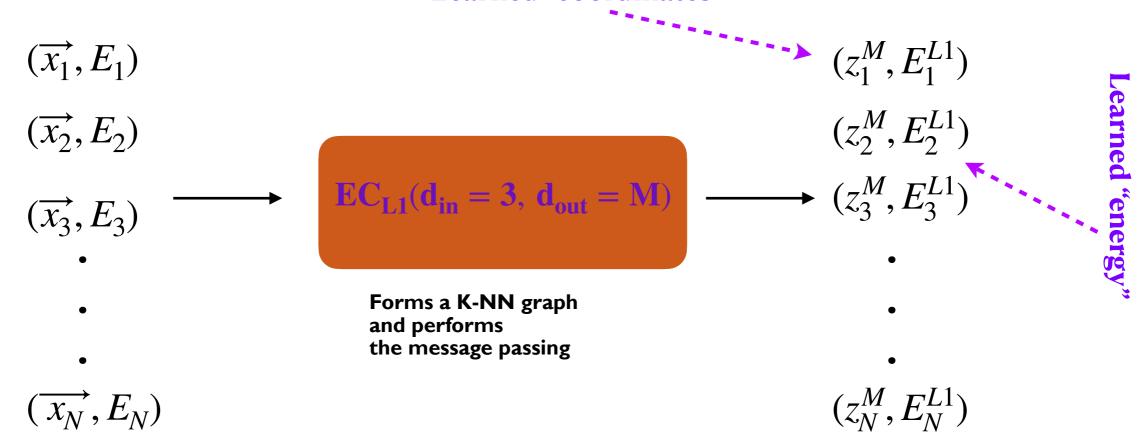
The graph network

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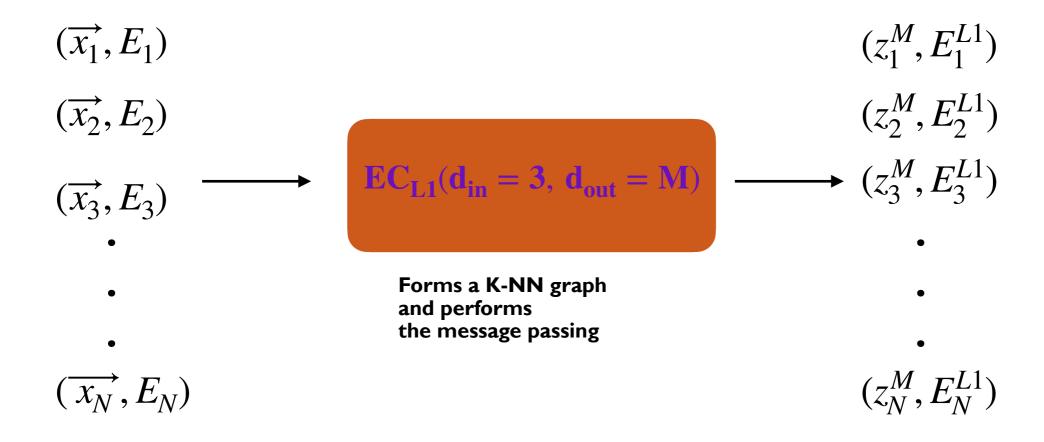
$$(e')_{i}^{l+1} = mean_{j \in \mathcal{N}(i)} \Theta_{e}(e_{j}^{l} - e_{i}^{l}) + \Phi_{e}(e_{i}^{l})$$

Learned "coordinates"



The graph network

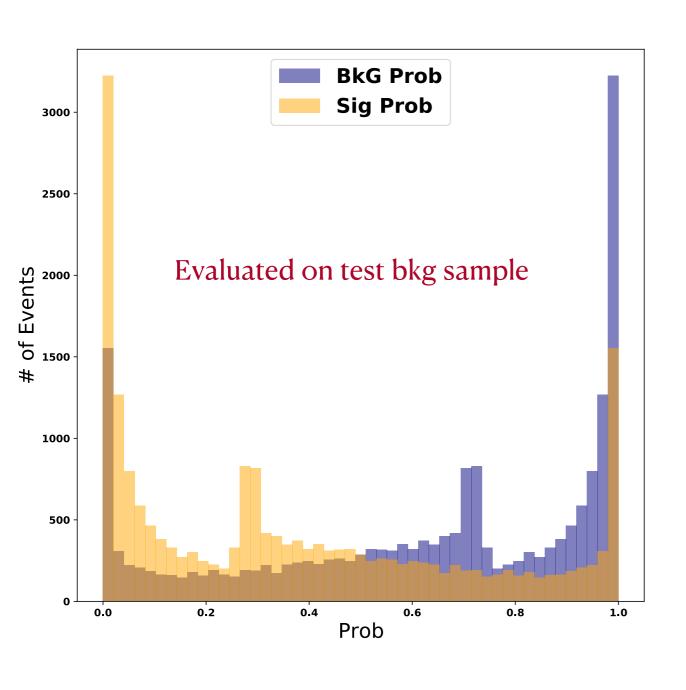
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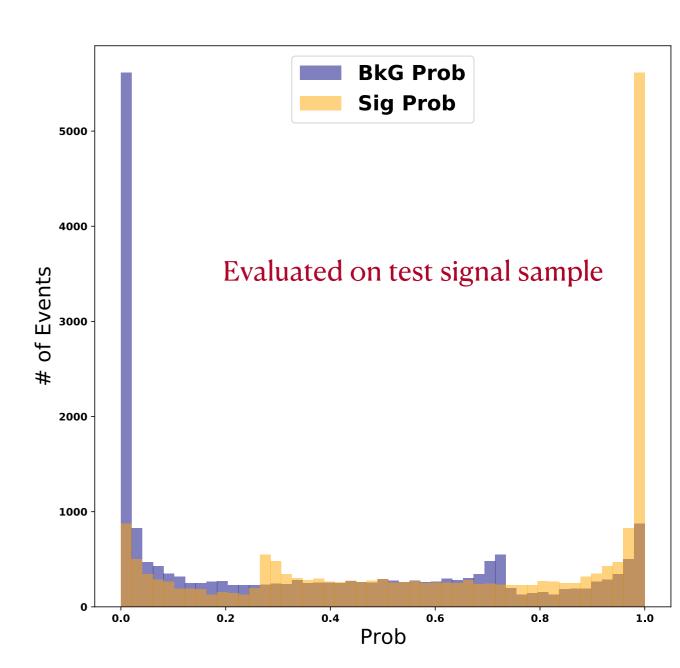


After p message passing layers, the q-th node has following energy representation:

$$\left(\mathbf{E}_{\mathbf{q}}, \mathbf{E}_{\mathbf{q}}^{\mathbf{L1}}, \mathbf{E}_{\mathbf{q}}^{\mathbf{L2}}, ..., \mathbf{E}_{\mathbf{q}}^{\mathbf{Lp}} \right) \longrightarrow \mathbf{MLP} \longrightarrow [p_{sig}, p_{bkg}]$$

Signal vs QCD bkg separation using GNN





Discussion

- **☑** Ultra boosted Di-Higgs production is an interesting physics case study for FCC
- We are performing a feasibility study with a ML (GNN) based method to increase the signal sensitivity.
- ☑ Initially looking into event classification: a demerit of the method would be no trivial way to extract the calibration factors.
- **Eventually, will use all the object level features in order to properly evaluate scale factor** for the events.
 - Representing events as heterograph might appear handy in this context. Will perform comparison of different NN models.
- Finally we wish to build an interpretable NN pipeline in order to relate individual physics observables which contribute towards the NN performance.

Backup

Classify events and scan the signal significance

